

# Dynamic Stability Analysis of Progressive Supranuclear Palsy Affected Gait Using Lyapunov Floquet Theory

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Abstract - Progressive supranuclear palsy (PSP) is a neurodegenerative disease with severe gait and balance deficits. There are no effective ways to assess dynamic balance during walking in PSP. The Lyapunov Floquet (LF) theory has been utilized to study dynamic balance in healthy and pathologic gait but has not been applied to PSP affected gait. In the current study, the medio-lateral motion of the center of mass during gait for 40 patients with PSP (PSP group) and 33 healthy older adults (Control group) were studied. Metrics from LF theory, such as the maximal Floquet multiplier (FM), maximal long-term Lyapunov Exponent (LE<sub>L</sub>), and maximal short-term Lyapunov Exponent (LE<sub>S</sub>) were used to study walking stability. Although all the gait dynamics for all the participants were stable and non-chaotic, the PSP group was observed to be closer to an unstable system and more susceptible to perturbations (|FM| closer to 1 and LEL closer to 0) than the Control group (p < 0.001). The control group's stability deteriorated, and the gait system became more susceptible to perturbations with age. Such a trend was not observed in the PSP group. The risk of falls increased with increase in cadence in the PSP group (p < 0.001). These findings demonstrate the potential of LF theory measures to evaluate dynamic stability in patients with PSP and the need for future research using quantitative measures.

Index Terms— Progressive supranuclear palsy, parkinsonism, dynamic balance, gait disorders, nonlinear dynamics, assessment in rehabilitation.

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#### I. INTRODUCTION

ROGRESSIVE Supranuclear Palsy (PSP) is a rapidly progressing, fatal neurodegenerative disease characterized by early onset of severe gait and balance abnormalities [2], [3]. The approximate age of disease onset for PSP is 40 years and older [4], [5]. PSP is often misdiagnosed as Parkinson's Disease (PD) due to the similar symptoms and disease presentations especially early in the disease course [6], [7]. One of the cardinal features that distinguish PSP from other parkinsonisms is early onset of postural instability leading to falls. Quantified gait analysis has been used to detect gait and balance abnormalities in PSP that may not be evident on clinical neurologic exam [8], [9]. Spatial temporal parameters show slow velocity, short stride length, reduced cadence and increased support times [10]. Balance abnormalities have focused on sway, which is a measure of static balance that is worse in PSP than PD and controls [11], [12]. Double support time during stance phase has been used by some as a surrogate of dynamic stability but does not offer a true evaluation of stability during walking [8]. Dynamic instability is a prominent early clinical feature in PSP which contributes to falls, disability and loss of independence [13]. Hence, an objective measure of dynamic balance of PSP affected gait is required and could provide early and accurate diagnosis. In our research, we investigate Lyapunov Floquet (LF) theory metrics as a measure of dynamic stability in PSP.

The dynamics of human walking can be approximated as a periodic time varying system. Dynamical system analysis techniques, like the LF theory, allow for the analysis of dynamic stability and the chaotic nature of such an approximated system. Metrics, such as the Lyapunov exponents (LE) and the Floquet multipliers (FM), derived from the LF theory have been applied to quantify dynamic stability during walking [14], [15], in neurological gait disorders such as multiple sclerosis [16] and cerebellar ataxia [17], and have been shown to identify fall-prone individuals [18], [19]. A dynamical system is considered stable if the absolute value of FM  $\leq 1$  [20]. The LE is used to analyze the chaotic behaviour of dynamical systems and the rate at which the system approaches/diverges from its attractor/repeller respectively. In a dynamical system representing gait, an attractor represents a state of stability (e.g., stable walking or stand still) toward which the gait dynamics naturally converge over time. Conversely, a repeller corresponds to a state of unstable gait pattern (e.g., falls) from which the system diverges, highlighting instability or unsteady behavior in walking. A system with LE  $\leq 0$  is considered stable. In a simulation to examine the stability of human walking, Bruijn et al. showed that LE when calculated over 0.5 gait cycle (LE<sub>S</sub>) may be a valid predictor of global gait stability [21]. Su and Dingwell observed that in a simulated walking model with perturbations, an increase in LE<sub>s</sub> captured the increased risk of falling [22]. Similarly in human gait studies, Kurz et al. studied gait stability (amount of divergence in the attractor's dynamics during walking) using LE, and observed that the LE was greater in patients with idiopathic PD compared to younger healthy individuals [23]. Another human gait study performed to measure dynamic stability showed that LE when calculated over 10 gait cycles (LE<sub>I</sub>) was more sensitive to gait instability in the medio-lateral (M/L)direction [24].

In this study, we investigated an application of the LF theory to PSP affected gait to identify a measure of gait instability. To our knowledge, such an application has not been successfully defined previously. The primary hypothesis tested was that the metrics derived from the LF theory that describe the stability and chaotic behavior of the system (LE<sub>L</sub>, LE<sub>S</sub>, and FM) would be different for PSP affected gait compared to healthy individuals within a similar age range.

#### II. METHODS

#### A. Participants

The patients with PSP were recruited from the Neurodegenerative Research Group (NRG) in the Department of Neurology, Mayo Clinic, Rochester, MN (NIH NINDS R01 NS089757 AND K23 NS124688). Study participants fulfilled the 2017 Movement Disorder Society clinical criteria for PSP [5] and were able to walk with or without assistance. Exclusion criteria were immobility due to advanced disease stage or an alternative cause of gait impairment such as Parkinson's disease, severe degenerative arthritis, or amputation.

For the control group, healthy participants (above 50 years of age, community dwelling, without any diseases/conditions that affected their gait) were recruited from the Rochester, MN community using solicitation methods such as flyers, reaching out to individuals from previous studies, and the Rochesterarea Older Adult Registry (ROAR) [25]. ROAR is a Mayo Clinic community-based, longitudinal primary care population of adults  $\geq$  65 years of age that collects information to address scientific questions on determinants of healthy aging. The healthy participants in the current study did not undergo a lower extremity surgery and had normal neuromuscular exam.

Informed consent was obtained prior to data collection under the guidelines set by Mayo Clinic's institutional review board (No. 20-013160, 23-004889, and 15-004618).

#### B. Data Collection

All data collection was conducted in the Motion Analysis Laboratory, Mayo Clinic, Rochester, MN. Demographic data, such as age, height, and body mass were collected initially. A neurologist measured disease severity within the PSP group

using the progressive supranuclear palsy rating scale (PSPRS), and PSPRS gait midline (PSPRS-GM). All participants were instructed to walk barefoot at a comfortable pace on a 10m level ground walkway for a minimum of 5 consecutive trials. Participants in the PSP group were secured in a ceilingmounted, fall-safety harness system (harness vest shoulder straps adjusted such that participants could freely achieve 15-degrees of trunk flexion from standing) for all trials. Since patients did not use assistive devices or therapist assistance during testing, the safety-harness did not influence our findings. Three-dimensional trajectory data for retroreflective markers placed on the bilateral heels (RHEE, LHEE), and posterior and anterior iliac crests (RPSI, LPSI, RASI, and LASI) were collected at 120Hz with a 14-camera motion capture system (Raptor 12HS, Motion Analysis Corporation, Rohnert Park, CA) for all trials. The first and last two strides for each trial were omitted to account for gait initiation and termination, resulting in an average of 19 total strides being analyzed over 5 trials. The timeseries data were further processed to eliminate frames with incomplete data due to poor marker visibility and were exported for analysis. Collection of clinical data and the gait study were performed on the same or adjacent days.

#### C. Data Processing

The average of the RPSI, LPSI, RASI, and LASI markers in the M/L direction was considered a surrogate for the M/L movement of the center of mass (CoM) and the average of the RHEE and LHEE markers in the M/L was considered a surrogate for the center of pressure (CoP) [26] (Fig 1 (a)).

The trajectory of the CoM relative to the CoP in the M/L direction  $(y(t) = CoM_{ML} - CoP_{ML})$  was calculated and the averaged value of the trajectory was subtracted (mean normalization). All 5 trials were stitched together and filtered for noise (lowpass Butterworth filter with a cutoff of 10 Hz [27]) to form a longer dataset (Y(t)) (representative example in Fig 2 (a), (c)) [1]. The application of LF theory to a stitched data set was validated by Sloot et al. [28] and a previous study [1]. A phase space representation for the system was defined as m(t) = [Y(t), Y(t)] where Y(t)is the time derivative of Y(t) (graphical representation in Fig 2 (b), (d)). Using an optimized time-delayed embedding, system estimation was performed to obtain the system  $M(t) = [m(t), m(t+\tau), m(t+2\tau), \dots, m(t+n\tau)]$  where  $\tau$ was the time delay, and n was the embedding dimension [1]. The monodromy matrix for the system was calculated as  $\Phi(T) = M(T) M^{-1}(0)$ . The eigen values of the monodromy matrix were the FM. The eigenvalues of R, where R = $(\log (\Phi(T))/T)$ , were the Floquet exponents. The real parts of the Floquet exponents were the LE<sub>L</sub>. Short term LE (LE<sub>S</sub>) was calculated using Rosenstein et al's algorithm [29]. The mean values of the FM, the maximal values of the LE<sub>L</sub> and the maximal values of the LE<sub>S</sub> were used to compare the stability and the behavior of the system under perturbations [1]. An LE > 0 indicated poor perturbation tolerance and the system was termed chaotic, and a FM > 1 indicated an unstable system. All calculations were performed in MATLAB 2021b (MathWorks, Natick, MA).

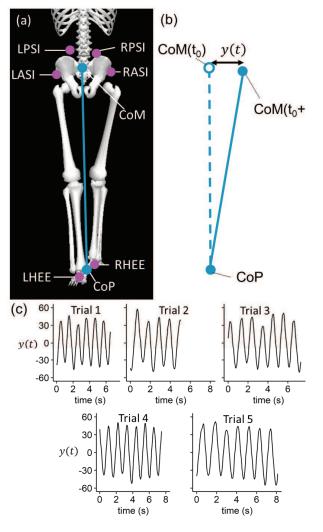


Fig. 1. (a) Frontal plane representation of the subject during gait, (b) Representation of the calculation of y(t) using the position of the CoM relative to the CoP, (c) Mean normalized medio-lateral (M/L) trajectory of the CoM for 5 trails. The movement of the CoM was similar for each trial. LPSI: Left superior posterior iliac spine; RPSI: Right superior posterior iliac spine; LASI: Left superior anterior iliac spines; RASI: Right superior anterior iliac spines; CoM: surrogate center of mass; CoP: surrogate center of pressure. [1].

#### D. Statistics

The participant's demographics data (age, height, body mass, and cadence) were analyzed using a Welch two sample t-test for any differences between the groups (Control vs. PSP). The normality assumption was tested using the Anderson-Darling test. An ANCOVA test was used to analyze the differences in the dependent variables (maximal LE<sub>L</sub>, maximal LE<sub>S</sub>, and mean FM) between the Control and PSP groups. The assumptions for ANCOVA were tested using the Anderson-Darling test (for normality of residuals) and the Levene's test (for homogeneity of variances). Any demographics variables found to be different between the groups, along with sex, were used as the covariates in the ANCOVA test. Any covariates that had a significant effect on the dependent variables were used in a linear regression for post-hoc comparison. Spearman's rank correlation test was used to study the correlation between the LF metrics (maximal LE<sub>L</sub>, maximal LE<sub>S</sub>, and mean FM) and the disease severity measures (PSPRS and

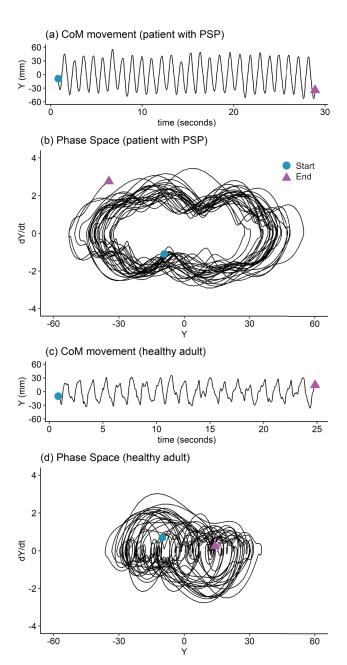


Fig. 2. Representative CoM data for a participant with PSP and a healthy participant. (a) and (c) Stitched and filtered CoM data; (b) and (d) Phase space representation of the system with the CoM data on the horizontal axis, and the derivative of the CoM data on the vertical axis. The start and end points are marked on both the graphs for reference.

PSPRS-GM). Statistical significance was set at p < 0.05. All analyses were performed using RStudio [30].

#### III. RESULTS

A total of 48 patients with PSP and 40 healthy individuals were recruited. Due to technical issues during data collection, only the data for 40 patients with a PSP (PSP group) and 33 healthy individuals (Control group) could be used for the current study. All participants in the study walked without the use of assistive devices or assistance from the study staff. The PSP and Control groups were similar in height and body mass. The participants in the PSP group were 7 years older (p < 0.001) and took 5 less steps per minute (p < 0.001) than

TABLE I PARTICIPANT DEMOGRAPHICS (MEAN  $\pm$  STD. [RANGE])

	Control group	PSP group	Statistics
N [Male/Female]	33 [15/18]	40 [19/21]	
Age (years)	$64 \pm 10 [51 \text{ to } 82]$	$71 \pm 7$ [58 to 86]	p = 0.001
Height (m)	$1.7 \pm 9.2$ [1.5 to 1.9]	1.7 ± 9 [1.5 to 1.9]	p = 0.283
Body Mass (kg)	$77.8 \pm 13 [54.6 \text{ to} \\ 102.6]$	$76.3 \pm 18.5 $ [48.6 to 117.8]	p = 0.69
Cadence (steps/min)	55 ± 4 [48 to 61]	50 ± 5 [38 to 59]	p < 0.001
PSPRS	-	35 ± 12 [12 to 58]	-
PSPRS-GM	-	$10 \pm 4 [2 \text{ to } 16]$	_

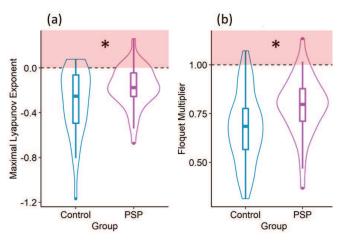


Fig. 3. Violin plot and boxplots for the Control and PSP groups. (a) The maximal LE<sub>L</sub> was greater for the PSP group than the Control group (p < 0.001). The red shaded area indicates a chaotic system. (b) The mean FM was greater for the PSP group than the Control group (p < 0.001). The red shaded area indicates an unstable system. Statistical significance is denoted by an asterisk (\*).

the participants in the Control group (Table I). Hence, sex, age and cadence were considered covariates for the ANCOVA tests. Additionally, none of the participants in the PSP groups fell during data collection.

#### A. ANCOVA Tests

The behavior of PSP affected gait was closer to a chaotic system (maximal  $LE_L = -0.17 \pm 0.18$ ) compared to that of healthy gait (maximal  $LE_L = -0.3 \pm 0.29$ ) (p = 0.015) (Fig 3 (a)). The values of maximal  $LE_L$  indicated that PSP affected gait was more susceptible to perturbation compared to healthy gait. Cadence and sex did not significantly affect the value of maximal  $LE_L$  of either the PSP affected gait or healthy gait (p > 0.05). The value of maximal  $LE_L$  reduced with age (p = 0.005) (Fig 4). The maximal  $LE_L$  for all the participants were less than zero. Hence, the gait for the studied PSP participants and Controls was chaotic in nature, with the PSP gait being more chaotic.

Short term LE was similar for both groups (Control group:  $2.58\pm0.31$ ; PSP group:  $2.6\pm0.44$ ; p=0.74). The participant's age and sex did not affect this metric (p>0.05) while the risk of falling, as measured by LE<sub>S</sub>, was significantly increased with increasing cadence (p<0.001) (Fig 5). This indicated that LE<sub>S</sub> was not able to reliably distinguish fall risk among PSP and control participants.

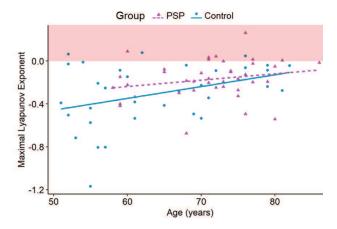


Fig. 4. Post-hoc linear regression analysis performed on the Control and PSP groups. The maximal LE $_{\rm L}$  for the Control group increased with age (p = 0.03), but such a relationship was not observed in the PSP group (p > 0.05). The red shaded area theoretically indicates a chaotic system.

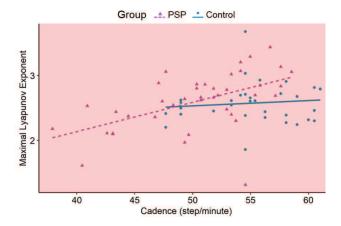


Fig. 5. Post-hoc linear regression analysis performed on the Control and PSP groups. The maximal LE $_{\rm S}$  for the control group did not change with cadence (p = 0.55). The maximal LE $_{\rm S}$  for the PSP group increased with cadence (p < 0.001), with the risk of falling increasing with cadence. The red shaded area theoretically indicates a chaotic system.

The FM for PSP affected gait  $(0.79 \pm 0.15)$  was closer to the condition of instability compared to healthy gait  $(0.68 \pm 0.18)$  (p < 0.001) (Fig 3(b)). Cadence and sex did not significantly affect the stability of either the PSP affected gait or healthy gait (p > 0.05), but age affected the stability significantly (p = 0.003) (Fig 6). Therefore, the FM indicated local instability in PSP affected gait.

#### B. Regression Tests

Age significantly affected the maximal  $LE_L$ . Linear regression analysis was performed post-hoc to study the relationship between age and maximal  $LE_L$  and stability. The gait in the control group became less tolerant to perturbation with age (slope = 0.1 per decade;  $R^2$  = 0.11; p = 0.03) (Fig 4). The effect of age on the perturbation tolerance of PSP affected gait was absent (slope = 0.06 per decade;  $R^2$  = 0.03; p > 0.05) (Fig 4). Therefore, PSP affected gait stability independent of age.

Cadence was a significant factor in the increase of risk of falling as measured by LE<sub>S</sub>. Post-hoc linear regression analysis showed that risk of falling did not change for the healthy

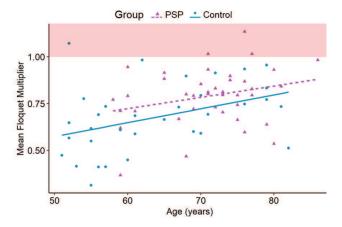


Fig. 6. Post-hoc linear regression analysis performed on the Control and PSP groups. The mean FM for the Control group increased with age (p = 0.02), but such a relationship was not observed in the PSP group (p > 0.05). The red shaded area theoretically indicates an unstable system.

participants (slope = 0.04 per 5 step/min;  $R^2$  = 0.01; p = 0.55) but increased significantly for the participants affected by PSP (slope = 0.23 per 5 step/min;  $R^2$  = 0.27; p < 0.001) (Fig 5). The participants affected by PSP had a greater range of cadence than the healthy participants, with the slowest participant with a PSP walking at only 38 steps/minutes. Hence, the participants in the PSP group had a greater risk of falling the faster they walked, suggesting dynamic instability.

A significant effect of age was also observed on the mean FM. The gait stability in the control group deteriorated with age (slope = 0.01 per decade;  $R^2$  = 0.13; p = 0.02) (Fig 6). Gait stability in the patients affected by PSP did not change with age (slope = 0.01 per decade;  $R^2$  = 0.05; p > 0.05) (Fig 6). Therefore, for healthy gait, the system's stability reduced, and its behavior became more susceptible to perturbation with age, but such a trend was absent in the PSP affected gait.

## C. Correlation Tests

The LF metrics and disease severity measures provided distinct information about the patient's gait. Specifically, the maximal LE<sub>L</sub> showed no correlation with PSPRS (rho = 0.04, p = 0.81) or PSPRS-GM (rho = 0.1, p = 0.54). Similarly, the risk of falling, as indicated by the LE<sub>S</sub>, did not correlate with PSPRS (rho  $\approx 0$ , p = 0.96) or PSPRS-GM (rho = 0.07, p = 0.68). Additionally, local gait stability, measured by the mean FM, exhibited no correlation with PSPRS (rho  $\approx 0.04$ , p = 0.79) or PSPRS-GM (rho = 0.08, p = 0.62). These findings suggested that LF metrics measured dynamic instability that was not specifically captured in clinical scales. Conversely, LF metrics were not appropriate for assessing overall disease severity in PSP patients. Rather, both metrics were useful and would add greatly to the quantification of the patient's health status.

#### IV. DISCUSSION

The current study modeled the M/L movement of the CoM relative to the CoP as an inverted pendulum. The system's stable point represented standing still, and "walking" was defined as oscillations around this point [31]. The ground

reaction forces applied to this system maintain its stability, at least for healthy human gait. However, PSP affected gait exhibited lateral instability [8], [32] making the analysis of dynamic stability in the M/L direction particularly important for individuals with PSP.

The results of the current study indicated that individuals with PSP experience dynamic instability, and their gait was less tolerant to perturbation compared to able-bodied individuals. While healthy gait stability and tolerance to perturbation decreased with age, PSP-affected gait demonstrated a greater degree of instability independent of age. This finding indicated that the dynamic instability in PSP-affected gait as measured by FM was not secondary to age and was greater than what would be explained by age alone. Additionally, the risk of falls in PSP-affected gait was found to be highly sensitive to cadence. Individuals with PSP and greater cadence (more steps per minute) were more dynamically unstable. This finding aligned with clinical observation in individuals with PSP who occasionally had a rapid uncontrolled small step that often culminated in a fall [13], [33].

The maximal LE for a system described its ability to overcome perturbations, and the average exponential rate of divergence or convergence of its trajectories [15], [34]. A positive LE indicated that, post perturbation, the system will diverge from its nearby trajectories, while a negative LE indicates convergence [35]. Therefore, in a system with LE < 0, a perturbation applied to the system would decay eventually. Although, most participants in the current study exhibited a LE<sub>L</sub> < 0, the dynamical system approximation for the PSP affected gait yielded a greater LE<sub>L</sub> compared to healthy gait, indicating a diminished ability to overcome gait perturbations. External perturbations (e.g., trips) and the inability to overcome them during gait caused instability and may lead to falls [36]. The result from the current study provided quantitative proof in support of this observation.

The correlation between LEs and the risk of falling was established for the elderly population [19], [37]. Patients affected by PSP are also known to be at a greater risk of falling [33], [38]. There is currently no literature on the values of LE<sub>S</sub> for PSP affected gait. The data in the current study showed that the healthy elderly participants and the participants affected by PSP had similar values of LE<sub>S</sub>. Hence LEs alone were not able to distinguish the fall risk among this population. Fall risk was measured by combining LEs with cadence such that LEs increased with increasing cadence among those with PSP. Bruijn et al.'s study showed that, for healthy gait, LE<sub>S</sub> did not change significantly in the M/L direction with gait speed [39]. The results of the current study agreed with this finding for the control group only. In the PSP group, those who walked at slower speeds had reduced LE<sub>S</sub> values. A similar relationship between cadence and frequency of falls in patients affected by PSP was discussed by Lindemann et al. [40]. Patients with PSP are well known to have a reduced cadence at their preferred speed of walking [41]. These findings highlighted the importance of reduced cadence as a possible compensatory change to reduce fall risk and maintain dynamic stability, particularly for individuals with PSP.

The participants in the PSP group had a more unstable gait compared to the control group. While gait stability in PSP patients was investigated in prior studies, to our knowledge, this study is the first to employ FM for assessing gait stability in this population. Amano et al. reported that patients with PSP increased their step width in an effort to increase the margin of spatial stability [32]. In another study, the double support time was used to indicate dynamic stability, however this was an indirect measure, assuming that double support time would be greater due to dynamic instability, but this metric could be affected by other issues such as limb pain [8]. The values of FM in the current study indicated that the gait of patients with PSP was more unstable compared to healthy participants.

PSPRS is a disease severity scale that is used by neurologists to grade the patients on various signs and symptoms related to PSP. The gait midline section of PSPRS (PSPRS-GM) grades patients on a broad range of symptoms related to gait (e.g., postural stability using pull test, neck rigidity, etc.) [42]. The LF metrics purely represent gait instability as opposed to clinical scales, such as PSPRS, that are an aggregated score of various motor and non-motor domains. Hence it is not surprising that there was a lack of correlation between these two modalities.

In the current research we demonstrated that LF metrics captured PSP related gait instability and vulnerability to perturbation independent of age. However, the literature presented inconsistent recommendations on using LE to describe gait affected by parkinsonism. Most existing work was performed in PD. Even though maximal LE<sub>L</sub> had construct validity, this validity was lacking in observational studies [43]. Lahrimi's study reported that the LE<sub>L</sub> in PD affected gait was greater than in healthy older adults, though the sample size was small (N = 5 per group) [44]. In contrast, Torres-Pardo et al.'s study, which had a larger sample size comparable to the current study (34 healthy and 42 participants diagnosed with PD), was inconclusive about the use of LE [45]. They observed that PD affected gait exhibited a greater value of LE<sub>L</sub> and a reduced value of LE<sub>S</sub> compared to healthy age-matched individuals. Maximal LE<sub>S</sub> had demonstrated predictive validity in observational studies [43]. However, Torres-Pardo et al.'s statement that "the gait of Parkinson's disease patients is more stable than that of healthy controls" requires further investigation. These conflicting results highlighted the need for additional research with larger sample sizes to better understand the role of LE in characterizing gait disturbances associated with parkinsonism.

The current study used values of long-term LE calculated analytically. The values of long term and short term LE used in literature were generally calculated using numerical approximation techniques [46]. These values of LE were generally greater than 0, indicating poor perturbation tolerance and high susceptibility to falls, even in healthy adults [16], [26], [46]. An analytical approach to calculate LE<sub>L</sub> and FM was recently discussed [1]. This analytical approach was shown to result in values of LE<sub>L</sub>, and FM that were closer to the observed gait characteristics.

# A. Study Limitations

A large dataset is essential for obtaining statistically precise estimates of LE [43]. For example, Bruijn et al. reported better precision in their estimates of LE at 150 strides [47]. The

current study included walking trials that were relatively short (10 m each). A stitching procedure was performed to create a longer data set (consisting of 19 gait cycles on average) and the LE<sub>L</sub> was calculated using an analytical method. This approach has been validated previously [1]. Sloot et al. also performed a similar study on healthy adults with impaired balance control due to galvanic vestibular stimulations and concluded that LE<sub>S</sub> calculated over multiple trials stitched together was a suitable measure to calculate local dynamic stability [28]. In a prior study performed, our group compared various methods for calculating FM and LE in a stitched dataset comprising multiple trials, yielding LE values consistent with those reported in the literature [1]. The goal of the current study was to identify group-level trends and differences in gait behavior between healthy gait and PSP affected gait. Reliable estimates of gait stability using non-linear measures can still be obtained using up to 14 strides, at which point a 30% variability about the median value can be expected [48], [49]. Multiple prior studies have used 10-14 strides to perform reliable analyses of nonlinear stability metrics like Lyapunov exponent analyses [4] [48], [49]. The findings of the current study, when considered alongside the observations listed above, suggested that using shorter trials was not a major limitation.

#### B. Future Work

The LE<sub>S</sub> could be investigated as a metric for quantifying fall risk in patients with PSP. Correlation between the disease severity scales used as outcome measures for PSP (e.g., PSPRS and the Unified Parkinson's disease rating scale) to the metrics of stability, perturbation tolerance, and risk of falls should also be investigated. Together, these avenues will contribute to a more comprehensive and adaptive framework for assessing and improving gait stability in patients with PSP.

#### V. CONCLUSION

This study highlighted key differences in gait stability between healthy older individuals and patients with PSP using the Lyapunov Floquet theory. PSP affected gait was observed to be more unstable and have reduced tolerance to perturbations compared to healthy gait. The fall risk in patients with PSP was also observed to be sensitive to their cadence. These findings support the need for future research on PSP affected gait and its stability using quantitative non-linear measures.

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